

Reproducible streamflow data analysis on the server or desktop using open source R packages.

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Competing Demands for Water Resources



EflowStats: An Implementation of Ecological Flows Assessment Methods.

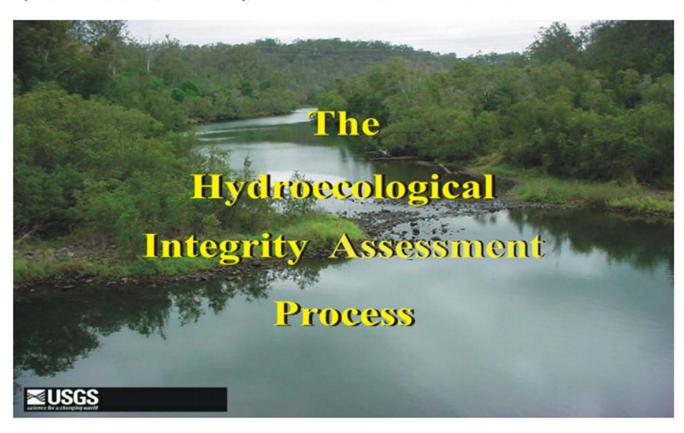
Background

Hydrologic Integrity
Assessment Process

- Hydrologic Index Tool
- Hydrologic Assessment Tool
 - Classify streams into groups
 - Identify set of significant indices
 - Classify study stream(s)
 - Establish hydrologic baselines, environmental flow standards, or evaluate proposed changes.

Users' Manual for the Hydroecological Integrity Assessment Process Software (including the New Jersey Assessment Tools)

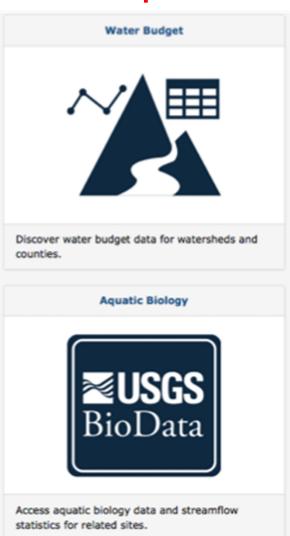
By James A. Henriksen, John Heasley, Jonathan G. Kennen, and Steven Nieswand

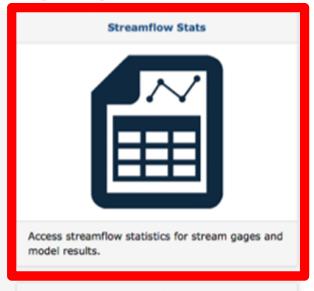


Open File Report 2006-1093

Data Resources Portal: http://cida.usgs.gov/nwc/

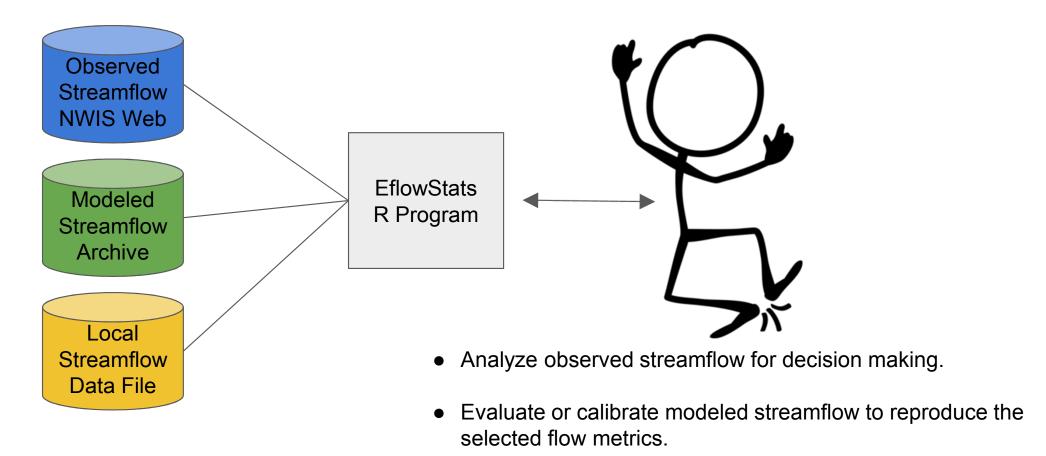
Scientists, Modelers, Managers... User Interfaces and Scripts Integration and **Processing Services Data Distribution** Services **Canonical Persistant Archives**







Data Access from Multiple Sources



Package functionality via desktop or web

R ON DESKTOP

R BEHIND WEBPAGE

Programmers and researchers can access particular statistic functions.



Decision makers and engineers can access suites of statistics and other summary functions.

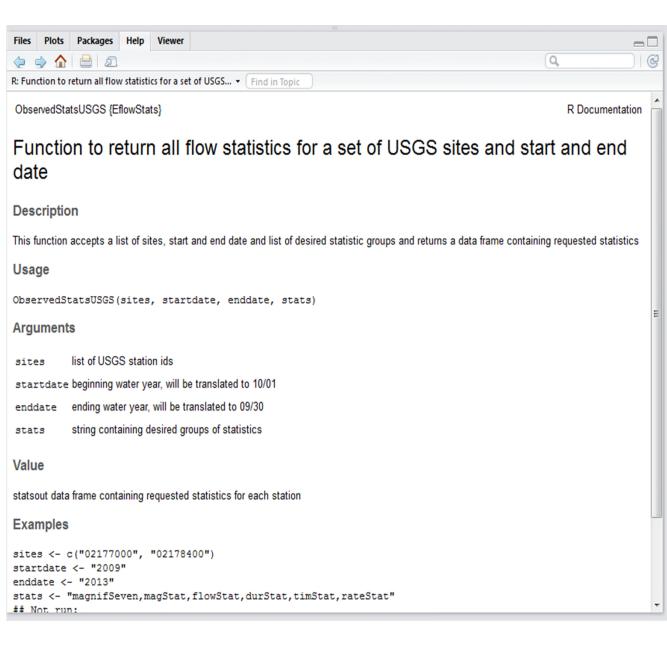


Any user can access the functionality via a web page for exploratory or curiosity driven investigations.



EflowStats on the desktop

- Run EflowStats in the R or RStudio environment
- Scripting for reproducible analysis
- All functions cataloged
- Help files with examples





EflowStats on the desktop

Low-level functions for custom workflows

```
#Specify station and parameters
##Select USGS site numbers
sites <- c("02177000", "02178400")

##Set date range
startdate <- "2009-01-01"
enddate <- "2013-01-01"

#Get Data
data <- getDataUSGS(sites,startdate,enddate)

#Calculate Statistics
fh1.2(data[[1]])</pre>
```



```
Console ~/USGS-R/EflowStats/ 🖒
> #Calculate Statistics
> fh1.2(data[[1]]
> #Specify station and parameters
> ##Select USGS site numbers
> sites <- c("02177000", "02178400")
> ##Set date range
> startdate <- "2009-01-01"
> enddate <- "2013-01-01"
> #Get Data
> data <- getDataUSGS(sites,startdate,enddate)</pre>
get_obsdata run on x_obs for site 02177000 1096
get_obsdata run on x_obs for site 02178400 1096
> #Calculate Statistics
> fh1.2(data[[1]])
$fh1
[1] 11.33
$fh2
[1] 10.19
>
```

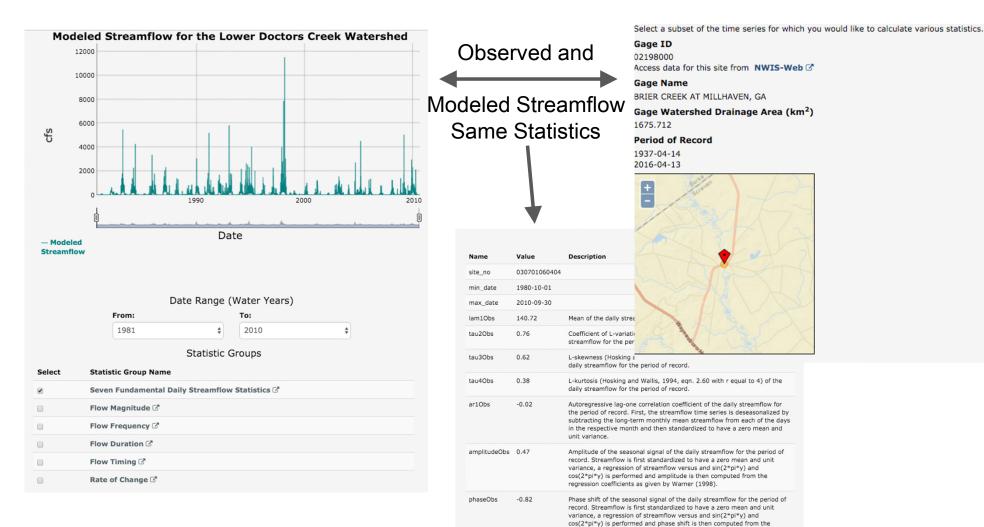
EflowStats on the desktop

High-level wrapper functions for standard tasks

```
#Specify station and parameters
##Select USGS site numbers
sites <- c("02177000", "02178400")
##Set date range
startdate <- "2009"
enddate <- "2013"
##Specify statistics
stats <- "magnifSeven,magStat,flowStat,durStat,timStat,rateStat"</pre>
#Calculate statistics
usgsStats <- ObservedStatsUSGS(sites,startdate,enddate,stats)</pre>
  site_no ^{\circ} min_date ^{\circ} max_date ^{\circ} lam10bs ^{\circ} tau20bs ^{\circ} tau30bs ^{\circ} tau40bs ^{\circ} ar10bs ^{\circ} amplitude0bs ^{\circ} phase0bs ^{\circ} ma1_mean_disc ^{\circ} ma2_median_disc ^{\circ} ma3_mean_annual_var ^{\circ} ma4 ^{\circ} ma5_skew
1 02177000 2009-10-01 2013-09-30
                                   697.04
                                               0.40
                                                        0.31
                                                                  0.15
                                                                           0.55
                                                                                         0.45
                                                                                                   -1.15
                                                                                                                 697.04
                                                                                                                                  531.0
                                                                                                                                                       71.77 64.78
                                                                                                                                                                         1.31
2 02178400 2009-10-01 2012-09-30
                                   170.91
                                               0.38
                                                        0.35
                                                                  0.23
                                                                           0.49
                                                                                         0.61
                                                                                                   -0.82
                                                                                                                 170.91
                                                                                                                                  136.5
                                                                                                                                                       83.46
                                                                                                                                                             61.20
                                                                                                                                                                         1.25
```



EflowStats on Data Resources Portal



comment

regression coefficients as given by Warner (1998).



Development Distribution



GRAN

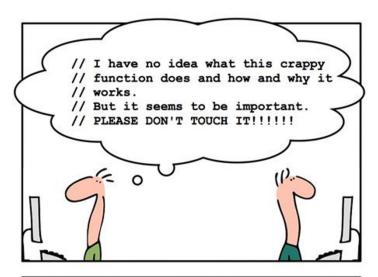
Geological Survey R Archive Network





Consistent best practices among USGS scientists

- All code must have an active USGS maintainer listed in the package
- Code must be maintained on GitHub
- Issue tracking in GitHub
- Continuous integration strongly encouraged

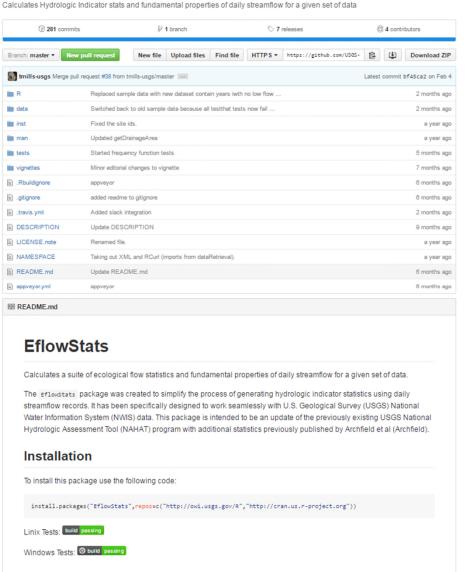




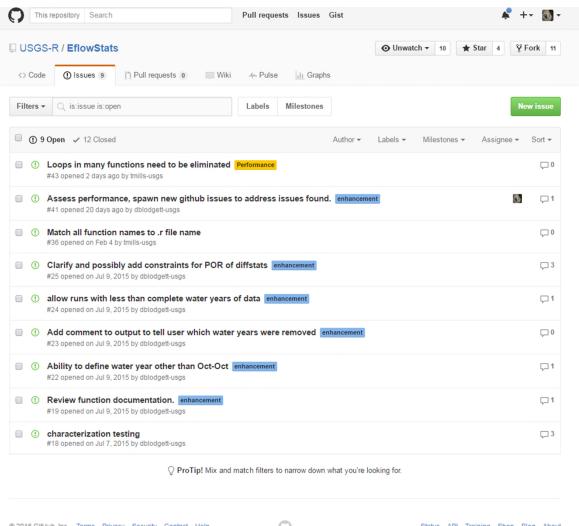




References

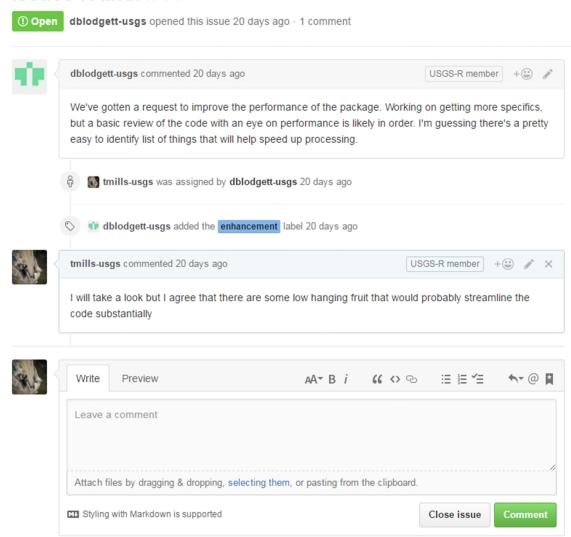








Assess performance, spawn new github issues to address issues found. #41





```
* checking DESCRIPTION meta-information ... OK
 78 * checking top-level files ... OK
 379 * checking for left-over files ... OK
380 * checking index information ... OK
                                                                                                                                   damental properties of daily streamflow for a given set of data
381 * checking package subdirectories ... OK
382 * checking R files for non-ASCII characters ... OK
383 * checking R files for syntax errors ... OK
                                                                                                                                    1 branch
                                                                                                                                                                      7 releases
                                                                                                                                                                                                         4 contributors
384 * checking whether the package can be loaded ... OK
   * checking whether the package can be loaded with stated dependencies ... OK
386 * checking whether the package can be unloaded cleanly ... OK
387 * checking whether the namespace can be loaded with stated dependencies ... OK
                                                                                                                                   file Upload files Find file HTTPS - https://github.com/USGS-
   * checking whether the namespace can be unloaded cleanly ... OK
389 * checking loading without being on the library search path ... OK
                                                                                                                                   s/master ···
                                                                                                                                                                                                     Latest commit bf45ca2 on Feb 4
 390 * checking dependencies in R code ... OK
391 * checking 53 generic/method consistency ... OK
392 * checking replacement functions ... OK
                                                                                                                                                                                                                     2 months ago
                                                                                                                                   with new dataset contain years with no low flow.
393 * checking foreign function calls ... OK
 394 * checking R code for possible problems ... OK
                                                                                                                                   mple data because all testthat tests now fail .
                                                                                                                                                                                                                     2 months ago
   * checking Rd files ... OK
 396 * checking Rd metadata ... OK
                                                                                                                                                                                                                        a year ago
 397 * checking Rd line widths ... OK
 398 * checking Rd cross-references ... OK
    * checking for missing documentation entries ... OK
                                                                                                                                                                                                                        a year ad
400 * checking for code/documentation mismatches ... OK
                                                                                                                                                                                                                     5 months ag
401 * checking Rd \usage sections ... OK
402 * checking Rd contents ... OK
                                                                                                                                   to vignette
                                                                                                                                                                                                                     7 mont
403 * checking for unstated dependencies in examples ... OK
404 * checking contents of 'data' directory ... OK
405 * checking data for non-ASCII characters ... OK
                                                                                                                                                                                                                          onths ago
406 * checking data for ASCII and uncompressed saves ... OK
407 WARNING
                                                                                                                                                                                                                      6 months ago
    'qpdf' is needed for checks on size reduction of PDFs
409 * checking installed files from 'inst/doc' ... OK
                                                                                                                                                                                                                     2 months ago
410 * checking for old-style vignette sources ... NOTE
411 Vignette sources only in 'inst/doc':
                                                                                                                                                                                                                     9 months ago
     'EflowStats.Rnw'
413 A 'vignettes' directory is required as from R 3.1.0
                                                                                                                                                                                                                        a year ago
414 and these will not be indexed nor checked
415 * checking examples ... OK
                                                                                                                                   url (imports from dataRetrieval).
                                                                                                                                                                                                                        a year ago
416 Examples with CPU or elapsed time > 5s
                      user system elapsed
                                                                                                                                                                                                                     6 months ago
418 getDataLocal 12.00 0.00 12.00
   ObservedStatsOther 6.09 0.02 6.36
420 * checking for unstated dependencies in 'tests' ... OK
421 * checking tests ...
422 Running 'testthat.R'
424 * DONE
426 Status: 1 WARNING, 2 NOTEs
428 'C:/projects/eflowstats/EflowStats.Rcheck/00check.log'
429 for details.
                                                                                                                                   atistics and fundamental properties of daily streamflow for a given set of data.
433 + [[ -n '' ]]
434 Packaging artifacts...OK
                                                                                                                                                      ess of generating by grologic indicator statistics using daily
435 Uploading artifact EflowStats.Rcheck\00check.log (3 KB)...OK
436 Uploading artifact EflowStats.Rcheck\00install.out (357 bytes)...OK
                                                                                                                                   cally designed to work seamlessly with U.S. Geological Survey (USGS) National
437 Uploading artifact EflowStats.Rcheck\EflowStats-Ex.Rout (104.1 KB)...OK
438 Uploading artifact EflowStats.Rcheck\tests\testthat.Rout (8.6 KB)...OK
                                                                                                                                   . This package is intended to be an update of the previously existing USGS National
                                                                                                                                   program with additional statistics previously published by Archfield et al (Archfield).
440 Uploading artifact EflowStats_4.1.0.zip (1.2 MB)...OK
                                                                                          Installation
                                                                                           To install this package use the
                                                                                             install.packages("Ef
                                                                                                                        ats",repos=c("http://owi.usgs.gov/R","http://cran.us.r-project.org"))
                                                                                          Linix Tests: build passing
                                                                                          Windows Tests: O build passing
```

References



Linux Tests: build error

Windows Tests: Duild passing

Scalable, stable, and collaborative research applications

Scalable

Stable

Collaborative

Low-level functions

Customized workflows



 Employ minimum set of best practices Consistent format for GRAN R packages

High-level functions
Standard outputs



 Code management and version control

Git and GitHub

 Scientist focuses on code and analysis not framework design

Web deployment

Dissemination to public

Continuous Integration

Github code availability facilitates collaboration

• Modify code != different results



Questions???



